

# Contribution of airborne remote sensing to high-throughput phenotyping of an hybrid apple population in response to soil water constraint



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# Context: new traits in fruit tree species

Breeding of fruit species focusing on socio-agronomic traits:

- fruit quality,
- resistance to bioagressors,
- architecture features / regularity of bearing

} long-term validity  
(*Laurens et al., 2000*)

Global changes → new breeding traits: tolerance to drought and/or better water use efficiency (WUE) (*Regnard et al., 2009*)

Phenotypic trait privileged: scion variety leaf response

Variability of stomatal behavior in young apple trees (*Massonnet et al., 2007 ; unpublished results*)

High-throughput methods needed for further genetic study (*Berger et al., 2010*)



# Context: leaf temperature & stress indices

Leaf temperature (infrared thermometer / thermal IR imaging)

- indicator for plant water status in annual crops and  $g_s$  estimation (*Jones et al., 1999*)
- irrigation scheduling via different water stress indices: Crop Water Stress Index (CWSI) based on  $T_s - T_a$  variation (*Idso et al., 1981*)

CWSI validity (*Jackson et al., 1981*):

- continuous cover,
- semi-arid and arid conditions,
- time-series available

Adaptation of CWSI to discontinuous cover (*Moran et al., 1994*)

Water Deficit Index (WDI) using  $T_s - T_a$  variation plotted against NDVI;

- potentially applicable to fruit trees in field conditions?



# Context: multispectral imaging approaches

## Multispectral plant imaging (RGB, Red Edge, NIR, TIR, fluorescence):

- controlled conditions

Lab diagnosis of stress response (*Chaerle et al., 2000*)

High-throughput phenotyping facilities (*Berger et al., 2010*)

- field

Monitoring water stress / scheduling cultural practices

- Annual crops (*Lebourgeois et al., 2010*)
- Perennial crops (*Sepulcre-Cantó et al., 2006; Grant et al., 2007*)

Phenotyping plants for differences in stomatal behavior (*Jones et al., 2009*)



# Methodological & scientific aims

Use multispectral imaging for phenotyping an apple hybrid population in field

Hypotheses :

- 1 : High-resolution imaging at tree scale (through airborne RGB / NIR / TIR imaging)  
→ relevant solution for phenotyping plant canopy T° variations
- 2 : HR imaging + stress index → sensible method for discriminating plant stomatal response to water stress (disentangling isohydric vs anisohydric behaviors)

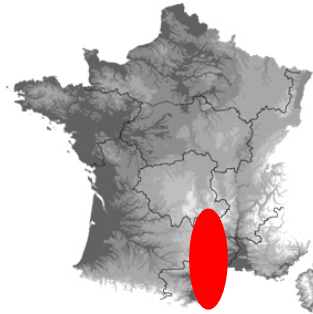


# Experimental set-up

## 1. Location

INRA-Diaphen  
Melgueil exp<sup>l</sup> farm

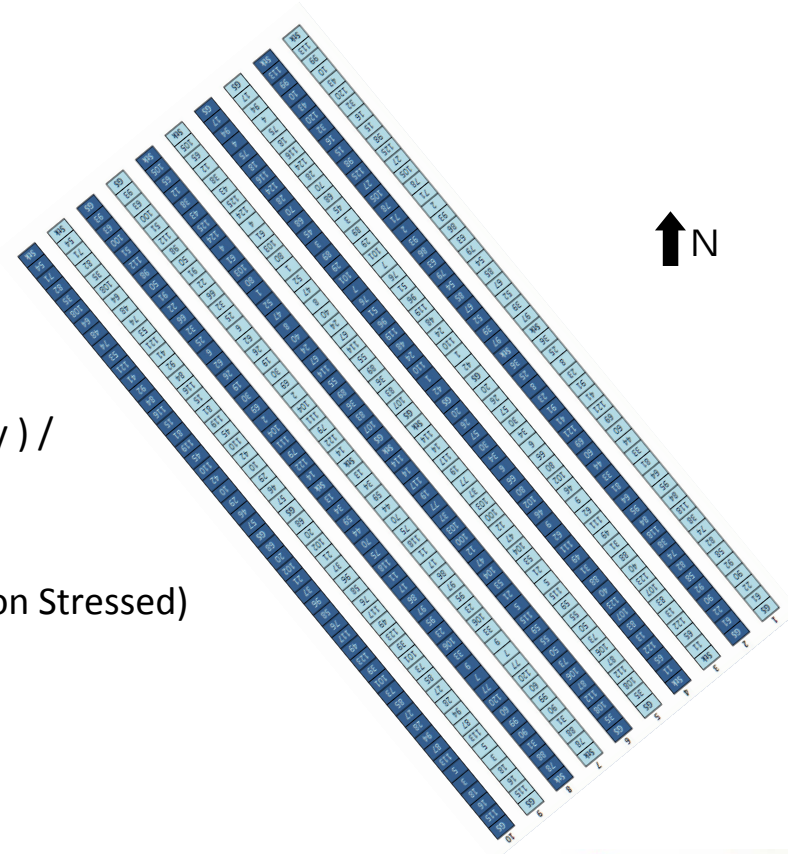
(43°36'35 N,  
3°58'52 E)



Not irrigated during summer (S)  
Always irrigated (NS)

## 2. Field set-up

- 488 apple trees
- 122 hybrids (Starkrimson \* Granny Smith progeny) / M9 roostock ; + parents
- 10 rows
- 2 seasonal water treatments : S, NS (Stressed, Non Stressed)
- 2 replicates





# Trial description

## 3. Environnemental and agro-physiological measurements

### Meteorology and soil

- Global radiation, Direct & diffuse PAR,
- Soil & air T°, air RH
- Wind speed
- Precipitations
- Soil analyses
- Soil water content (Sentek capacitive sensors)
- Soil water potential (Watermark™ probes)
- Field resistivity mapping (Geocarta)

### Agronomic data

- Individual tree crop
- Trunk diameter and section
- LAI, SPAD (5 hybrids subset)

### Ecophysiological data

- Predawn leaf water  $\Psi$
  - Minimum stem water  $\Psi$
  - Photosynthesis rate (A/Ci)
  - Chlorophyll fluorescence
  - Canopy T° (non-imaging)
  - Stomatal conductance
  - Leaf and/or fruit  $\Delta^{13}\text{C}$  (proxy of WUE)
- 3 to 5 hybrids







# High resolution remote sensing 2010 campaign

## 1. Acquisition system



RGB and NIR  
cameras  
(Canon EOS  
400D)



Thermal IR camera  
(Flir B20HSV,  
320\*240px)



300m

GPS + PDA (Altitude / Location)  
+ T<sub>a</sub> and HR sensors

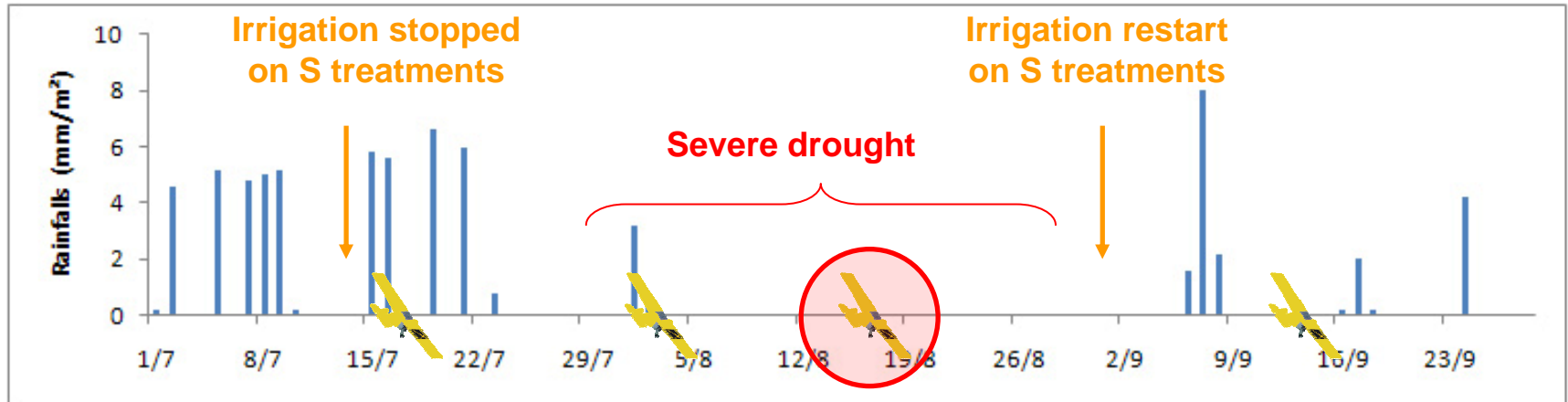




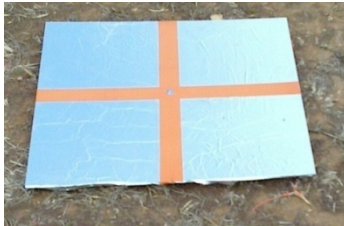


# High resolution remote sensing 2010 campaign

## 2. Airborne imaging over the trial



4 ULA flights (RGB, NIR, TIR) coupled with ground measurements:



Aluminium targets (for TIR images geolocation)



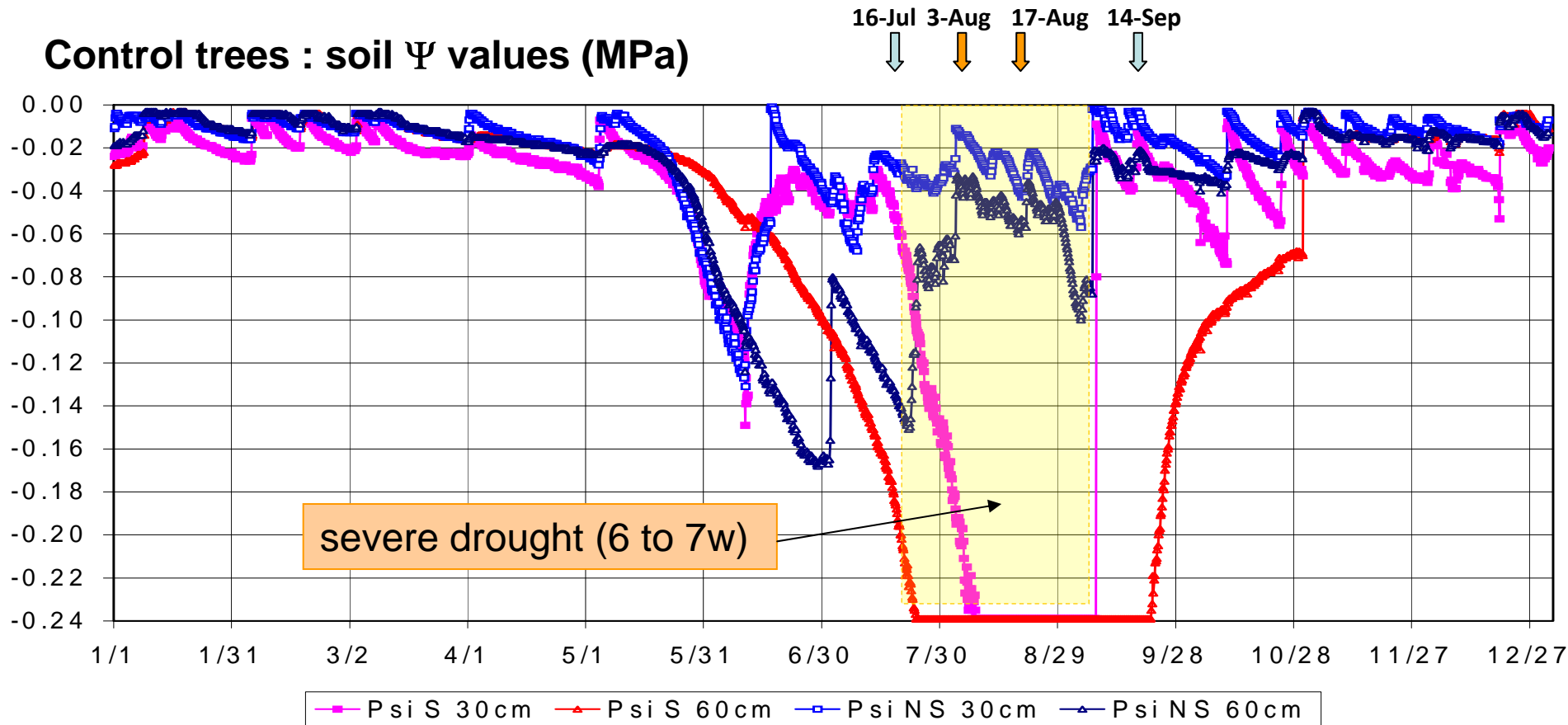
Thermal Infrared thermometer KT19  
Heitronics® [8 – 14]  $\mu\text{m}$  measurements  
on hot and cold targets





# Water stress scheduling

## Control trees : soil $\Psi$ values (MPa)

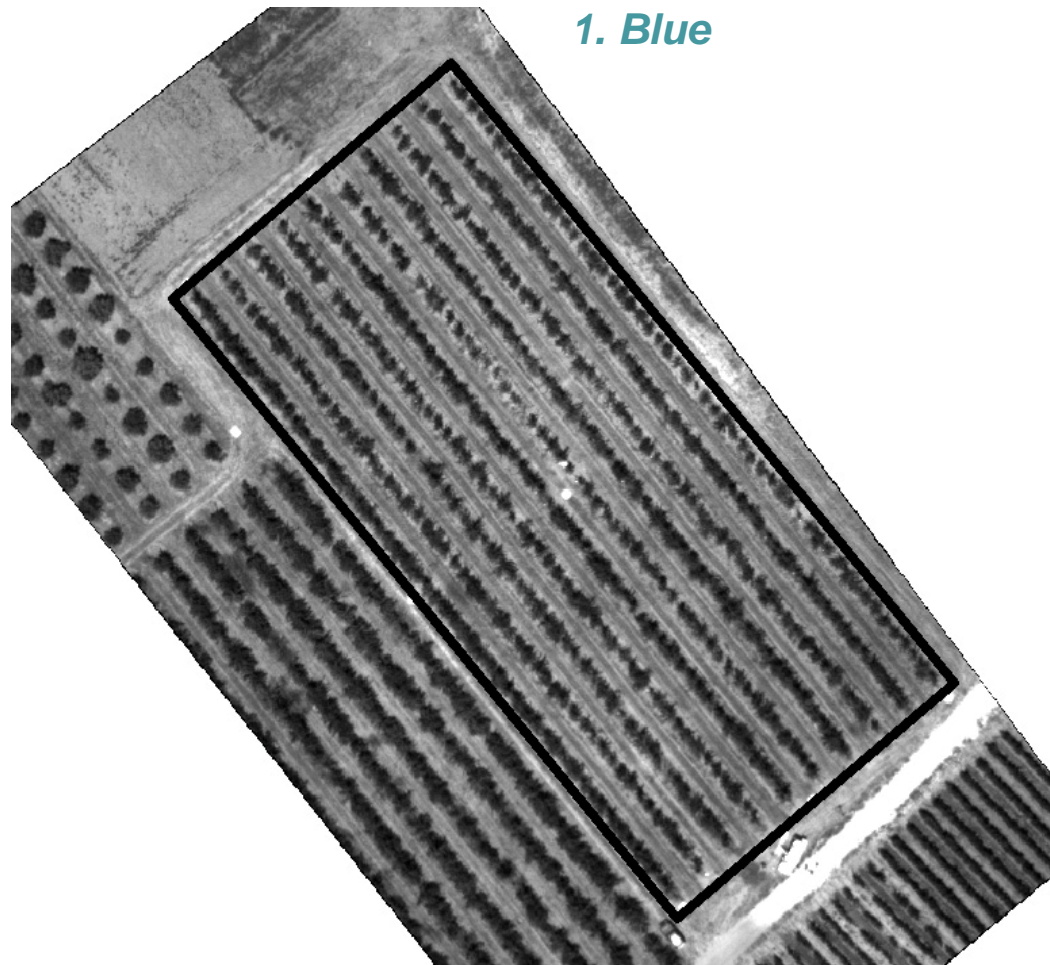


## Parallel measurements: predawn LWP, soil humidity (Sentek probes)



# Image processing & indices

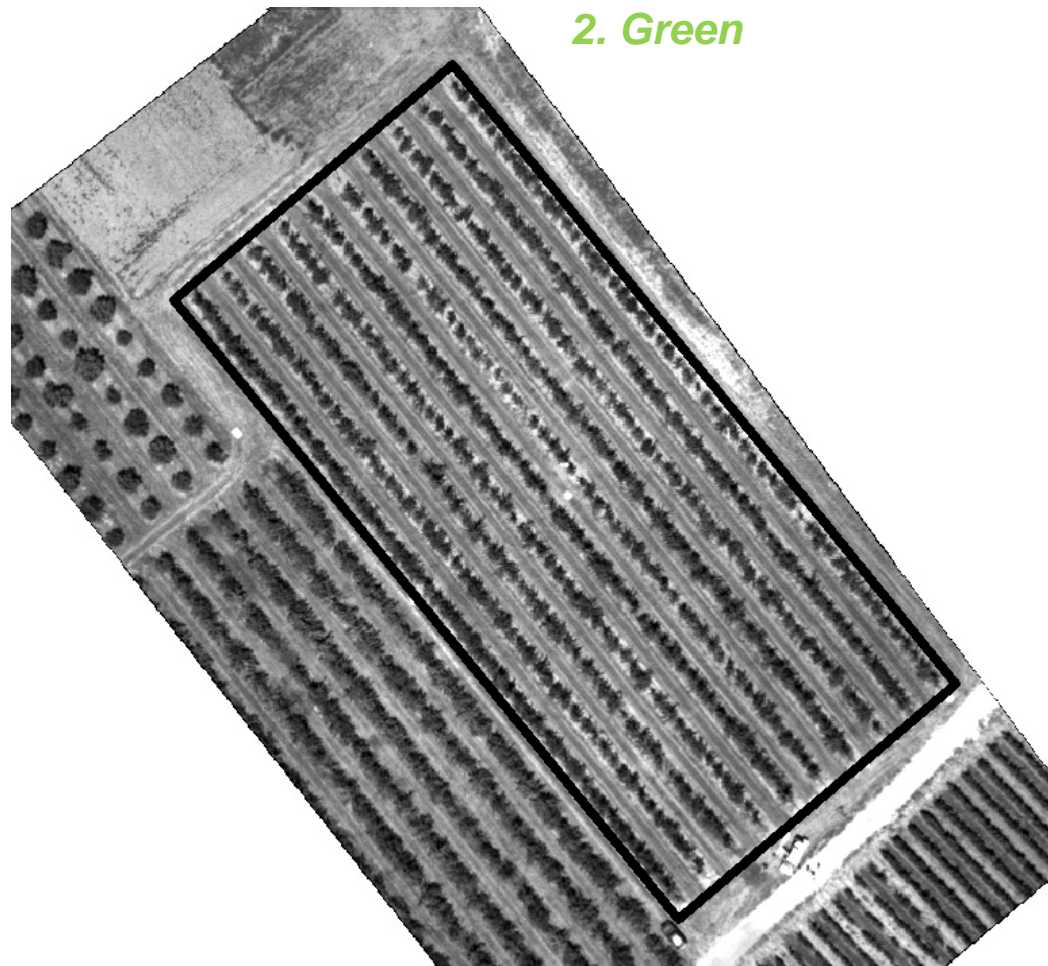
## 3. RGB and NIR images → four spectral bands





# Image processing & indices

## 3. RGB and NIR images → four spectral bands

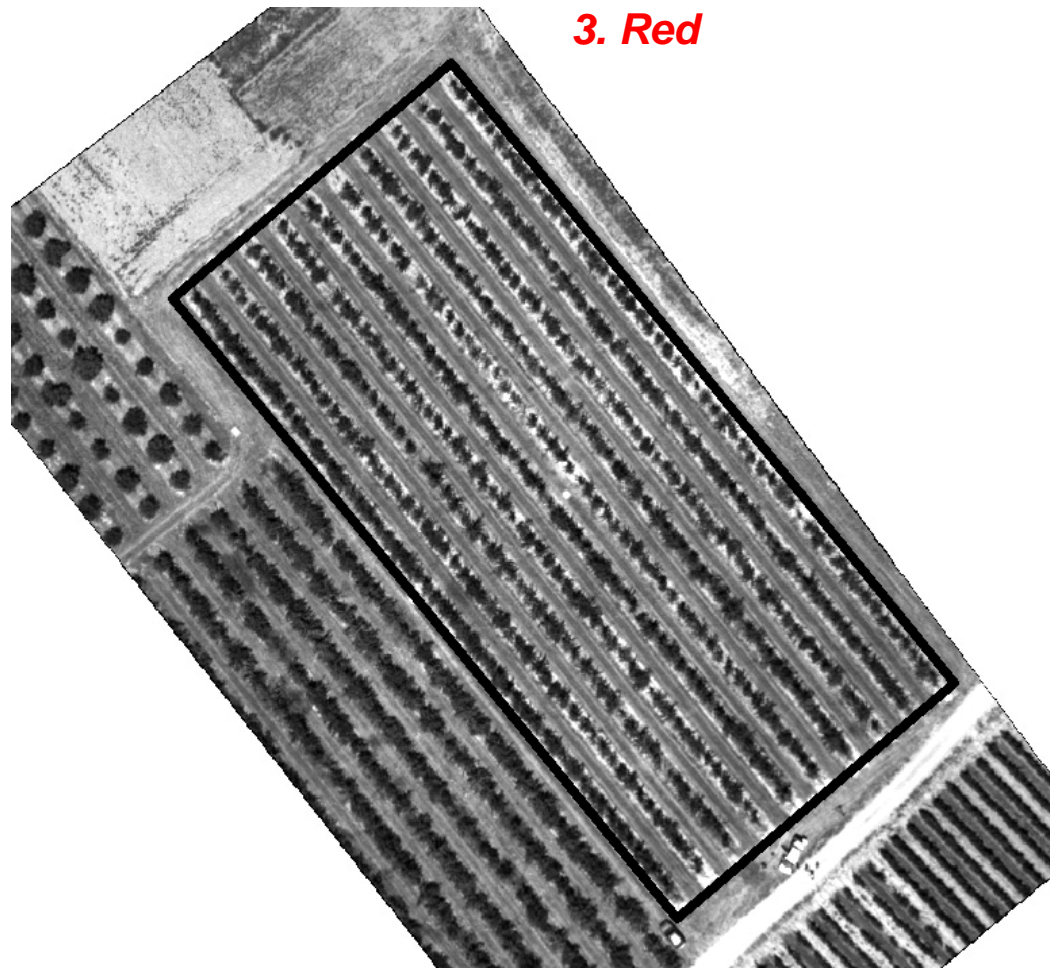






# Image processing & indices

## 3. RGB and NIR images → four spectral bands

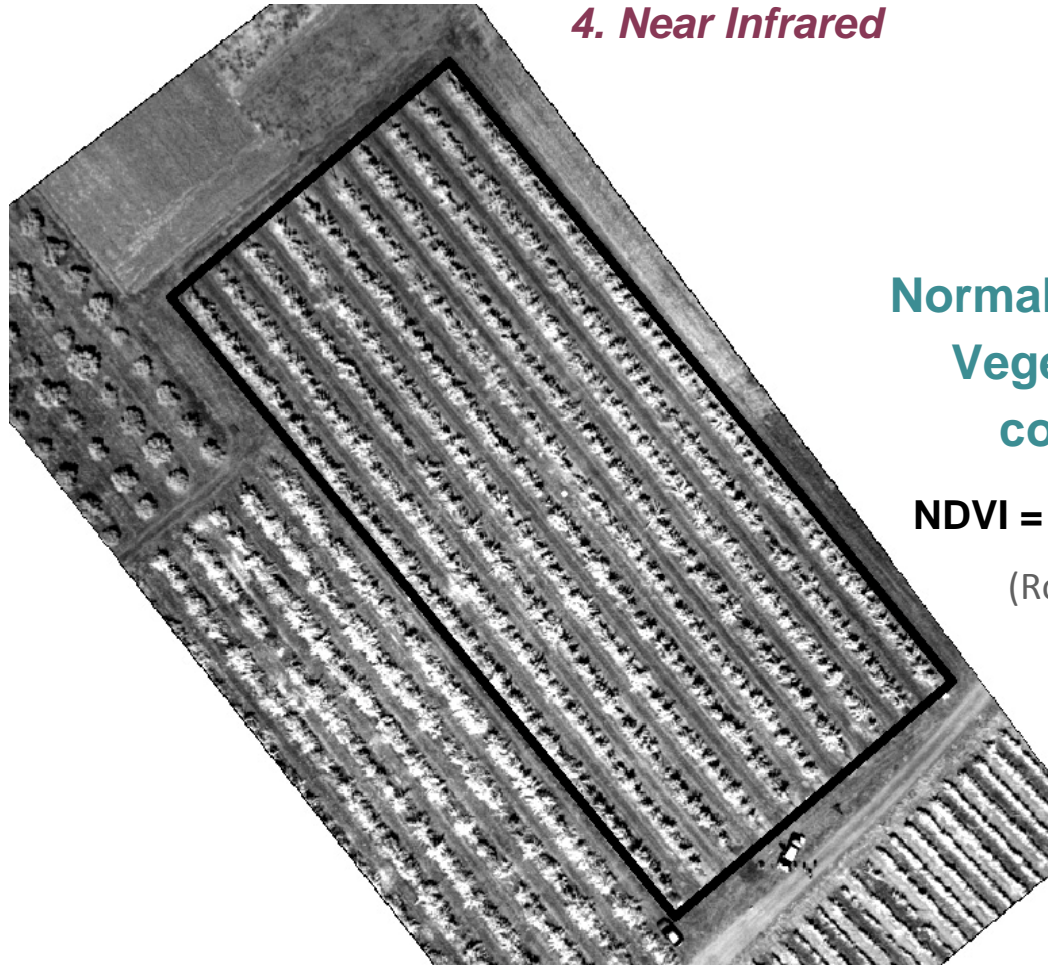




# Image processing & indices

## 3. RGB and NIR images → four spectral bands

### 4. *Near Infrared*



### Normalized Difference Vegetation Index computation

$$\text{NDVI} = (\text{NIR} - \text{R}) / (\text{NIR} + \text{R})$$

(Rouse et al., 1973)



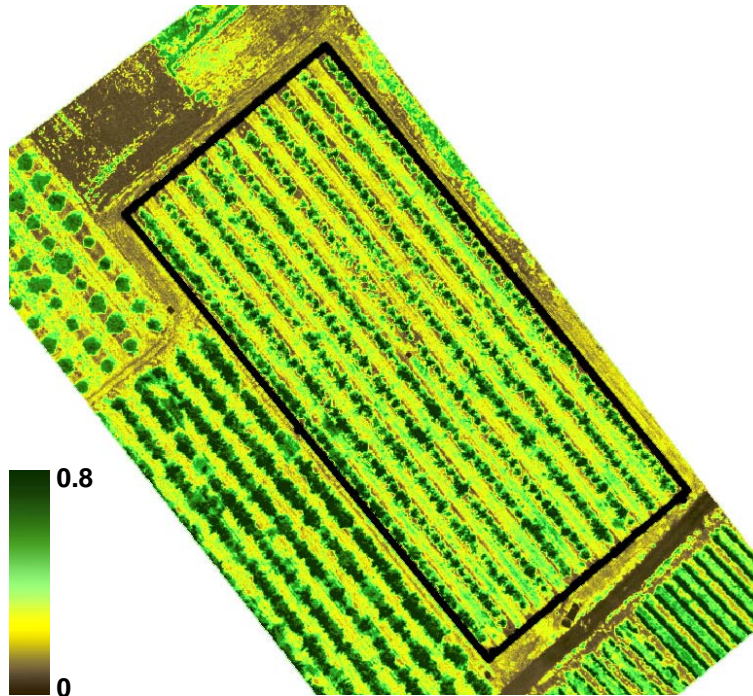


# Image processing & indices

## 3. Vegetation Index

$$\text{NDVI} = (\text{NIR} - \text{R}) / (\text{NIR} + \text{R})$$

NDVI  
image



## 4. Thermal IR image ( $T_s - T_a$ )

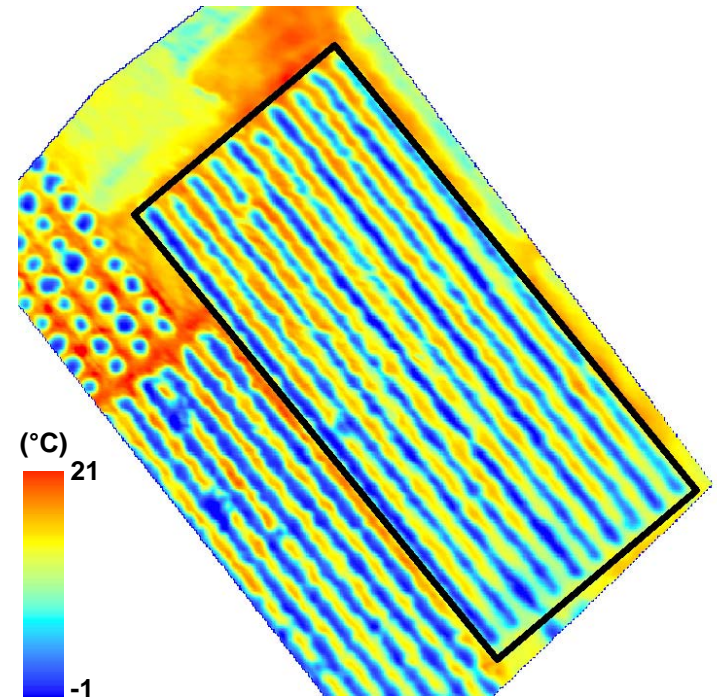


Image resolution: RGB / NIR : 5cm ; TIR : 30cm

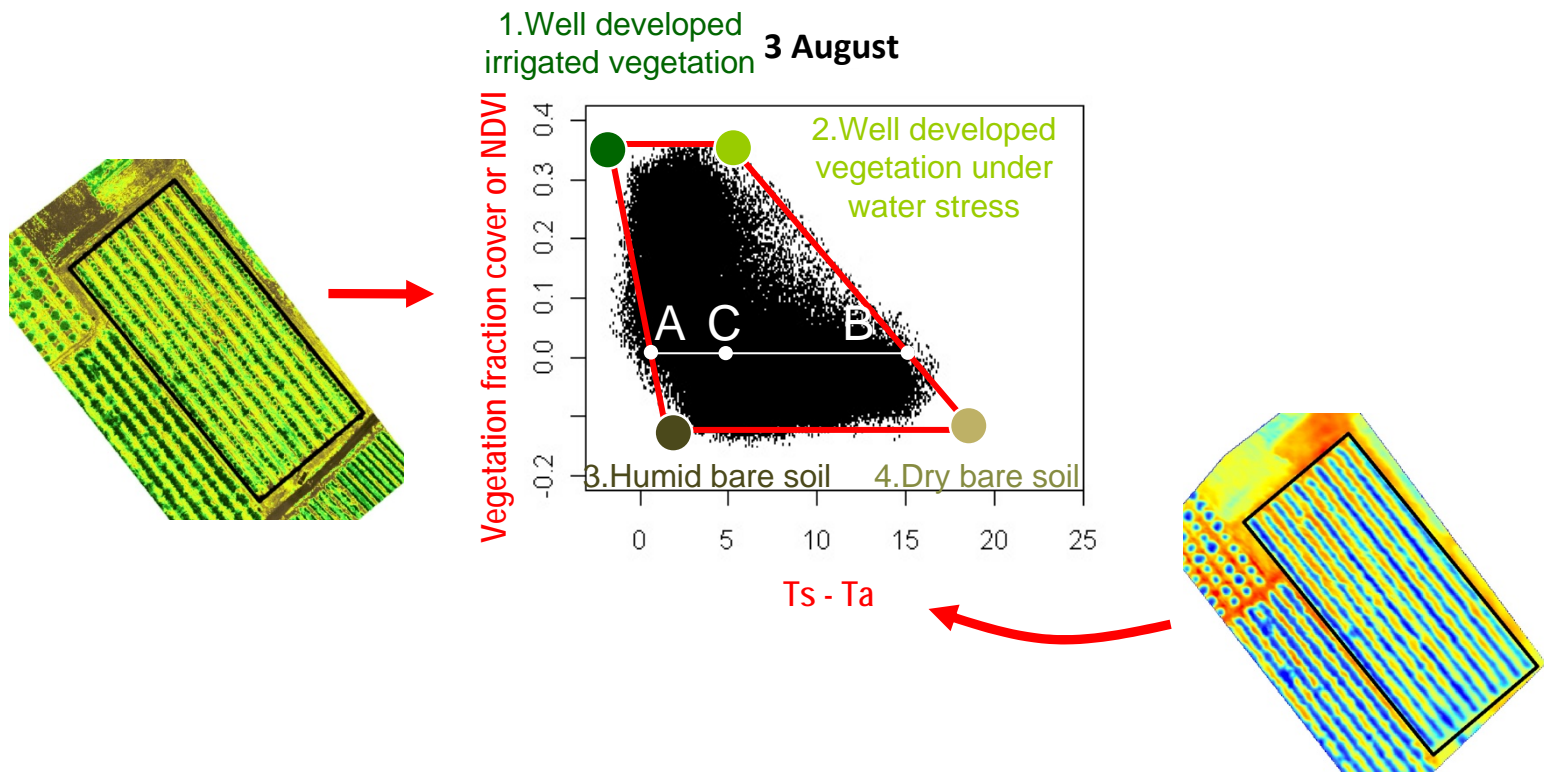
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# Image processing & indices

## 5. Water Deficit Index (Moran et al, 1994)

$WDI = 1 - (ET_{Act} / ET_{Max}) = AC / AB$   
Designed for partially covering crops

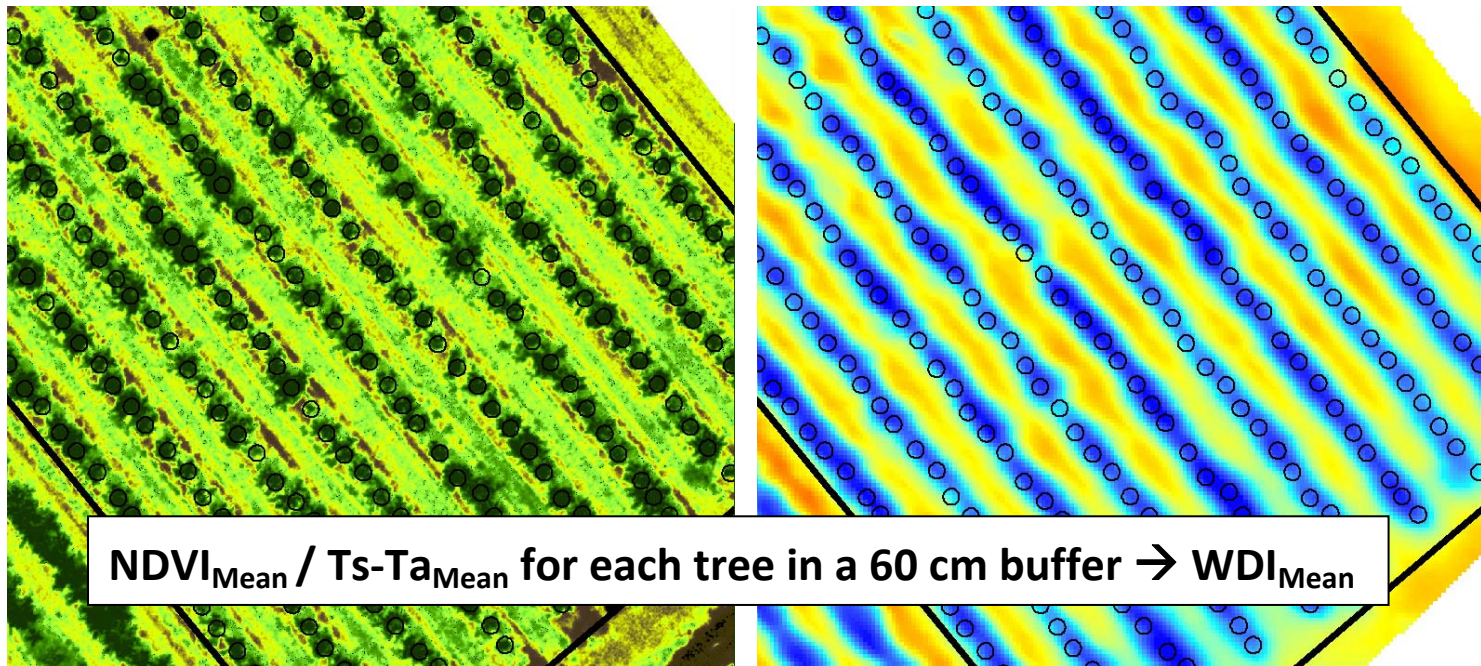






# Delimitation of tree canopies

## 6. NDVI-based location of each tree central zone

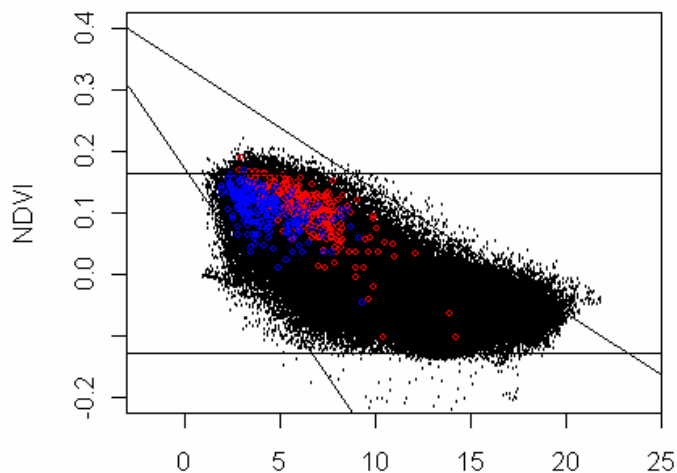




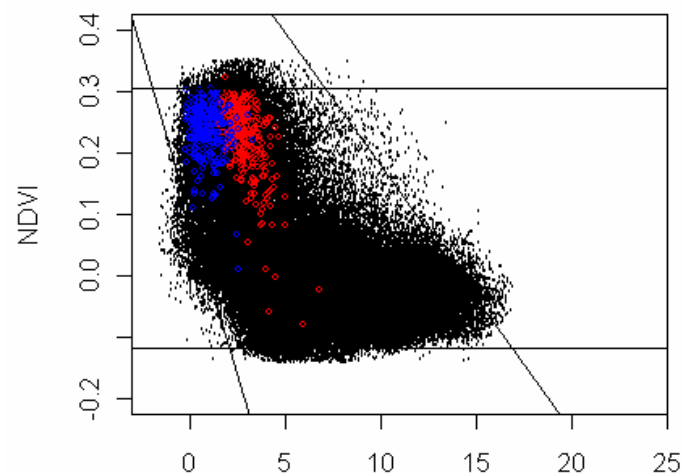
# Preliminary results: Water Deficit Index

**STRESSED trees**  
**NON STRESSED trees**

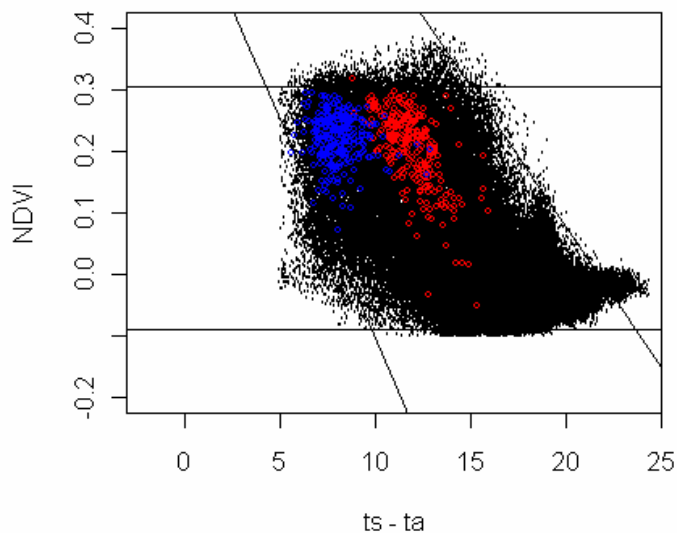
16 july



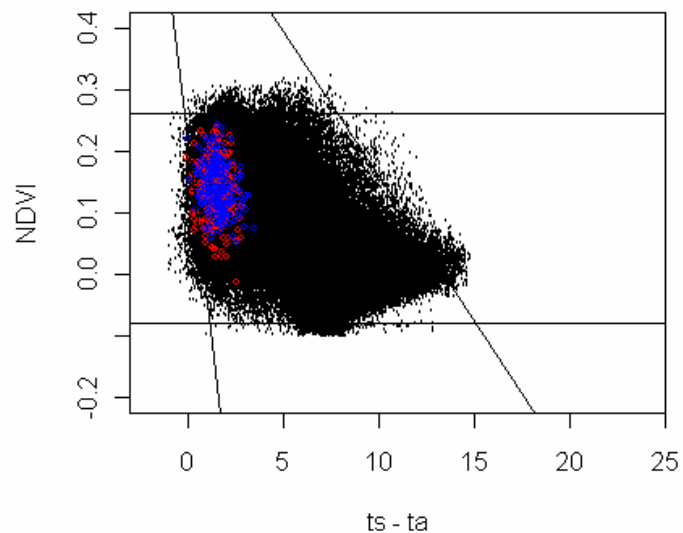
3 august



17 august



14 september





# Preliminary results: Genotype & Drought effects

2-way ANOVA applied to WDI values (2010 campaign)

Effect		07-16	08-03	08-17
Genotype	<i>F</i>	1.8	1.9	1.5
	<i>p</i> -value	$<10^{-4}$	$<10^{-4}$	$<10^{-2}$
Drought	<i>F</i>	501	772	1661
	<i>p</i> -value	$<10^{-6}$	$<10^{-6}$	$<10^{-6}$
G * D	<i>F</i>	0.5	0.5	0.6
	<i>p</i> -value	p# 1.0	p# 1.0	p# 1.0

n.s. effects on Sept 14



# Constraints & limits

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- Field meteorological constraints
- « Snapshot » datasets (which potentiality to reveal contrasting behaviors?) ;
- Current TIR image resolution: 30 cm
- Atmospheric corrections:  $T^{\circ}_{\text{Top of canopy}}$  needed (non imaging thermoradiometers; thermic transfer model)
- Assessment of NDVI variations resulting from other factors than LAI and soil cover fraction (leaf chlorophyll and N content)
- Computation of WDI trapezoid envelope: information of satellite images





# Methodological & scientific challenges

- Flight program continued (2011-12)
  - Proxi-imaging: methodological aspects (on a tree population subset) and image analysis (*Cohen et al., 2005 ; Möller et al., 2007*)
  - Assessing the resolution of airborne remote sensing vs proxi- TIR images:
  - Relevancy of other Water stress indices, e.g. S-Sebi (*Roerink et al, 2000*)
  - Field validation of water stress index with apple tree water status
- 
- Robustness of leaf traits: greenhouse (young stage) vs field (maturity stage) ; phenotyping young trees on the PhenoArch high-throughput facility (2013)
  - Cluster analysis of hybrid apple progeny on the basis of WDI and other criterions (leaf and/or fruit  $\Delta^{13}\text{C}$ )
  - Heritability analysis on functional traits, QTL detection and more refined genetic studies related to QTL zones



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